

# Wake stabilization with machine learning control



Guy Y. Cornejo Maceda<sup>1</sup>

B. R. Noack<sup>234</sup>



F. Lusseyran<sup>2</sup>



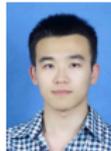
M. Morzynski<sup>5</sup>



L. Pastur<sup>6</sup>



N. Deng<sup>6</sup>



<sup>1</sup>LIMSI, CNRS - UPR3251 Paris-Sud University, Paris-Saclay University, France

<sup>2</sup>LIMSI, CNRS - UPR3251 Paris-Saclay University, France

<sup>3</sup>Harbin Institute of Technology, China

<sup>4</sup>Technische Universität Berlin, Germany

<sup>5</sup>Poznan University of Technology, Pologne

<sup>6</sup>IMSIA - UMR9219, ENSTA ParisTech, France

**ASTRID-ANR-17- FLOWCON**, Contrôle d'écoulements turbulents en boucle fermée par apprentissage automatique

JDD, Paris, June 6<sup>th</sup>, 2019

# The fluidic pinball - a nonlinear system for control benchmark

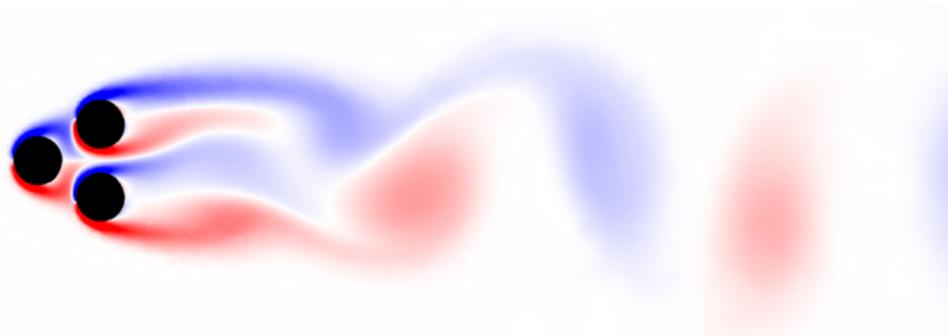
ground transport



airborne transport



wind turbine



Marek Morzynski  
**DNS**

**Finite Elements Method**

8633 vertices

*3<sup>rd</sup> order in time and*

*space*



# The fluidic pinball - a nonlinear system for control benchmark

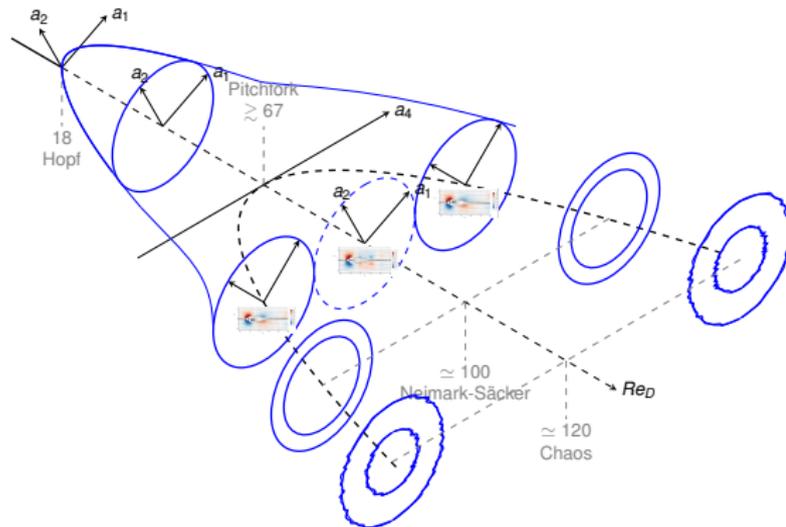
ground transport



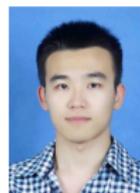
airborne transport



wind turbine



Bifurcation diagram of the fluidic pinball



Nan Deng



Luc Pastur



Deng et al.  
JFM 2018

# The fluidic pinball - a nonlinear system for control benchmark

ground transport



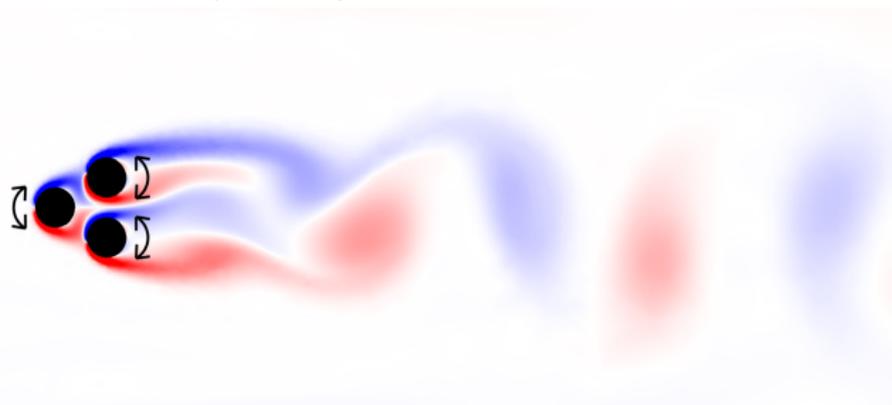
airborne transport



wind turbine



Means of action -  $\vec{b} = (b_{front}, b_{bottom}, b_{top})$



$\omega_z$

5

0

-5



Marek Morzynski  
DNS

Finite Elements Method

8633 vertices

3<sup>rd</sup> order in time and  
space



# The fluidic pinball - a nonlinear system for control benchmark

ground transport



airborne transport

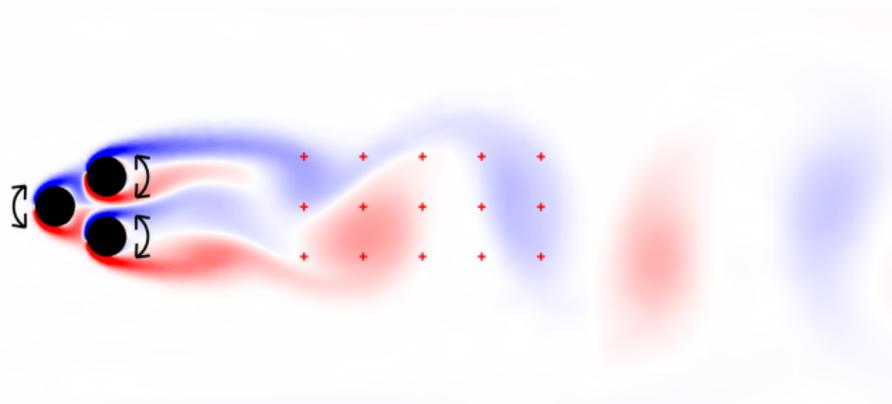


wind turbine



Sensors feedback -  $\bar{s}$

MIMO exploration -  $\vec{b} = \mathbf{K}(\bar{s})$



$\omega_z$

5

0

-5



Marek Morzynski  
DNS

**Finite Elements Method**

8633 vertices

3<sup>rd</sup> order in time and  
space



# The fluidic pinball - a nonlinear system for control benchmark

ground transport



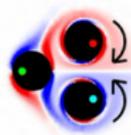
airborne transport



wind turbine



Boat-tailing

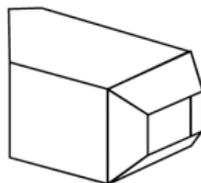


$T=70$

$\omega_z$



Boat-tailing/cavity



# The fluidic pinball - a nonlinear system for control benchmark

ground transport



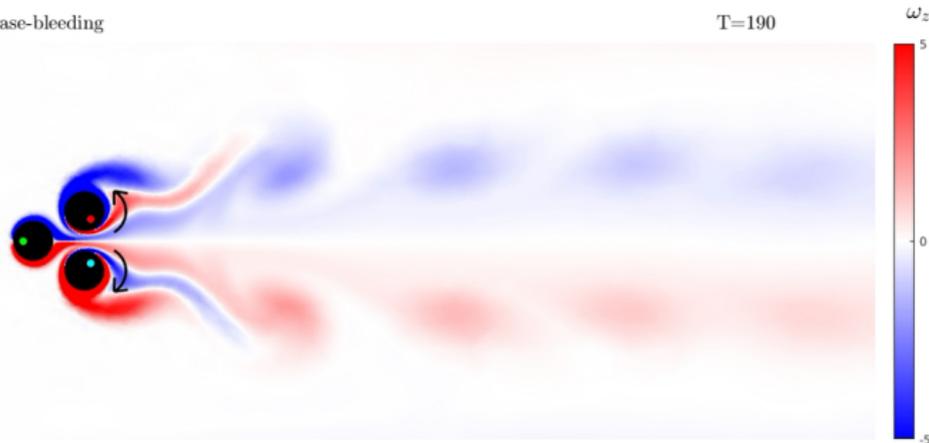
airborne transport



wind turbine



Base-bleeding



Splitter plate

# The fluidic pinball - a nonlinear system for control benchmark

ground transport



airborne transport

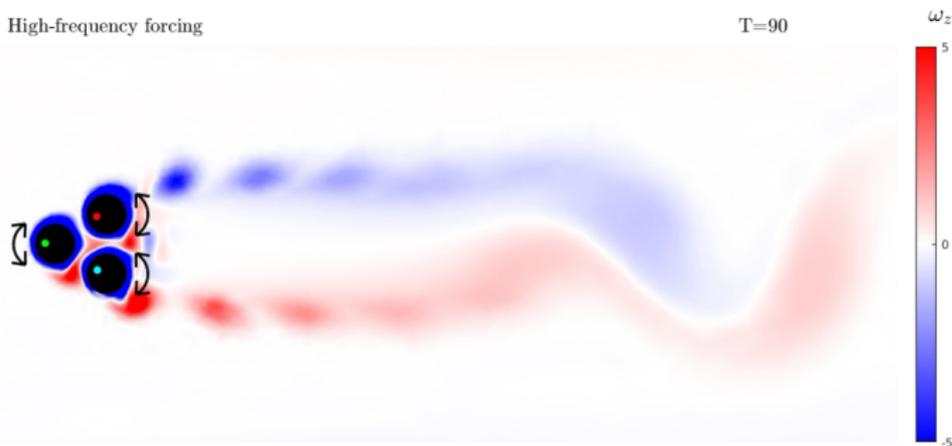


wind turbine



High-frequency forcing

$T=90$



Frequency crosstalk!

# The fluidic pinball - a nonlinear system for control benchmark

ground transport



airborne transport

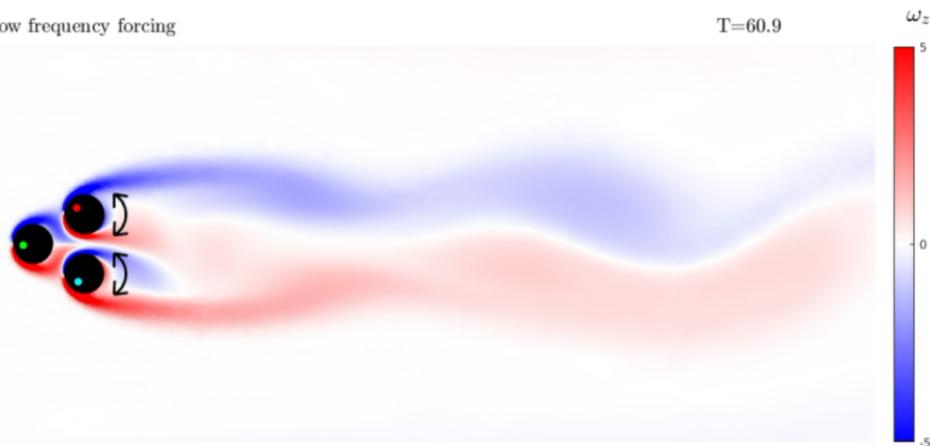


wind turbine



Low frequency forcing

$T=60.9$



$\omega_z$

5

0

-5

Frequency crosstalk!

# The fluidic pinball - a nonlinear system for control benchmark

ground transport



airborne transport



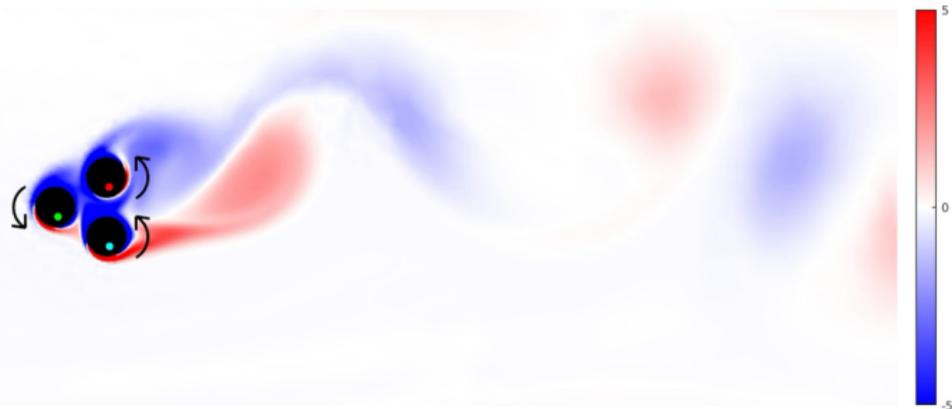
wind turbine



Magnus effect

$T=70$

$\omega_z$



Alcyone

# The fluidic pinball - a nonlinear system for control benchmark

ground transport



airborne transport

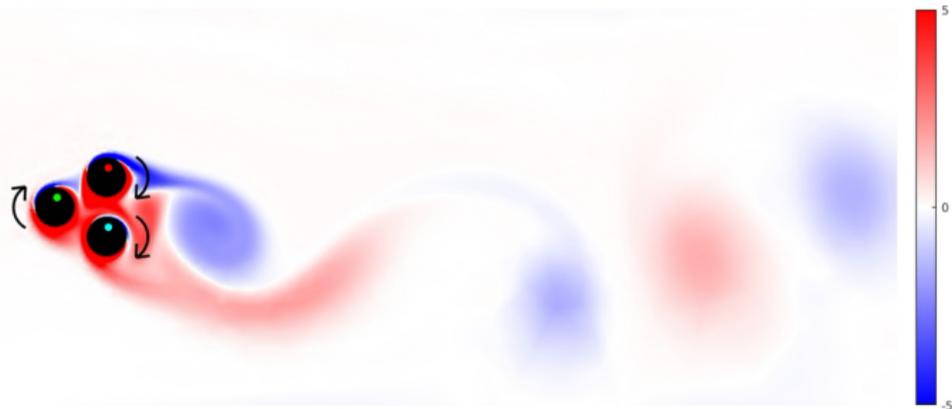


wind turbine



Reverse magnus effect

$T=70$



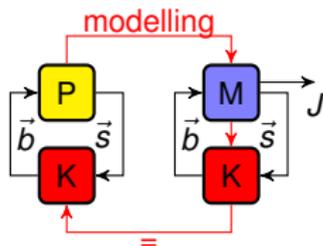
Alcyon

# Control theory

## Model-Based Control



Norbert Wiener



$$\begin{aligned}\frac{d\vec{a}}{dt} &= F(\vec{a}, \vec{b}) \\ \vec{s} &= G(\vec{a}, \vec{b}) \\ \vec{b} &= K(\vec{s})\end{aligned}$$

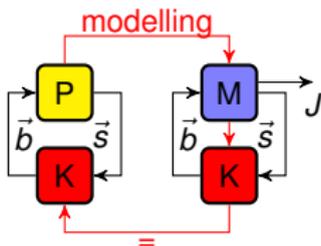
$F$  : dynamical model of the plant ( $P$ )

# Control theory

## Model-Based Control



Norbert Wiener



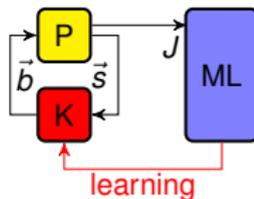
$$\begin{aligned}\frac{d\vec{a}}{dt} &= F(\vec{a}, \vec{b}) \\ \vec{s} &= G(\vec{a}, \vec{b}) \\ \vec{b} &= K(\vec{s})\end{aligned}$$

$F$  : dynamical model of the plant ( $P$ )

## Artificial Intelligence Control



Control problem as a regression problem



$$K^* = \operatorname{argmin} J(K)$$



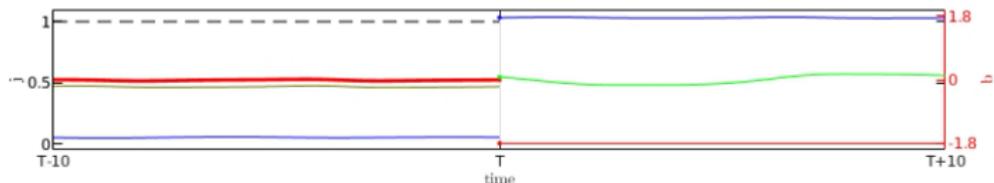
T. Duriez,  
S. Brunton,  
B.R. Noack.  
Springer, 2016.



# Results of AIC

MLC derived control law

T=134



$$b_{front} = -s(t)$$

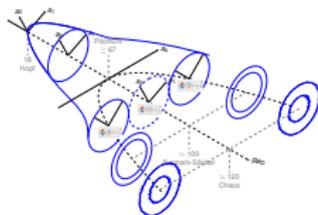
$$b_{bottom} = 1.76 - s(t)s(t-1)$$

$$b_{top} = -1.80$$

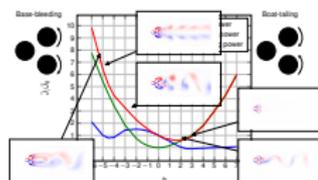
**46.0%** net drag power saving!  
**AIC = boat-tailing + phasor control**  
100 individuals x 10 generations = **1000 evaluations!**

# Summary and related works

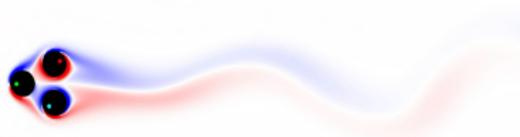
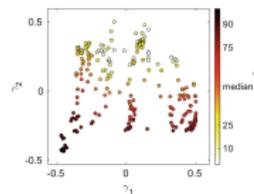
Bifurcation Diagram



Open-loop study

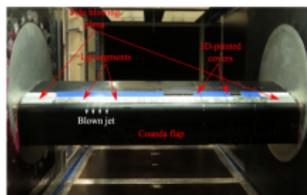


ML acceleration



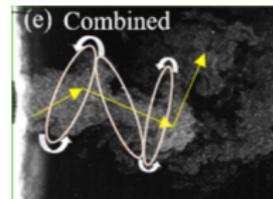
LAMIH, Valenciennes

Camilla Chovet, Laurent Keirsbulck



TU Braunschweig

Richard Seeman



HIT, Shenzhen

Yu Zhou



Thank you for your attention!

-

Questions?

Guy Y. Cornejo Maceda  
LIMSI,CNRS,Paris-Sud University, Orsay, France  
✉ [guy.cornejo@limsi.fr](mailto:guy.cornejo@limsi.fr)